

# A First-Order Radiative Transfer Model for Microwave Radiometry of Forest Canopies at L-Band

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**Abstract**—In this study, a first-order radiative transfer (RT) model is developed to more accurately account for vegetation canopy scattering by modifying the basic  $\tau-\omega$  model (the zero-order RT solution). In order to optimally utilize microwave radiometric data in soil moisture (SM) retrievals over vegetated landscapes, a quantitative understanding of the relationship between scattering mechanisms within vegetation canopies and the microwave brightness temperature is desirable. The first-order RT model is used to investigate this relationship and to perform a physical analysis of the scattered and emitted radiation from vegetated terrain. This model is based on an iterative solution (successive orders of scattering) of the RT equations up to the first order. This formulation adds a new scattering term to the  $\tau-\omega$  model. The additional term represents emission by particles (vegetation components) in the vegetation layer and emission by the ground that is scattered once by particles in the layer. The model is tested against 1.4-GHz brightness temperature measurements acquired over deciduous trees by a truck-mounted microwave instrument system called ComRAD in 2007. The model predictions are in good agreement with the data, and they give quantitative understanding for the influence of first-order scattering within the canopy on the brightness temperature. The model results show that the scattering term is significant for trees and modifications are necessary to the  $\tau-\omega$  model when applied to dense vegetation. Numerical simulations also indicate that the scattering term has a negligible dependence on SM and is mainly a function of the incidence angle and polarization of the microwave observation.

**Index Terms**—Emission, microwave radiometry, scattering, soil, vegetation.

Manuscript received June 7, 2010; revised September 10, 2010 and October 22, 2010; accepted October 30, 2010. Date of publication December 23, 2010; date of current version August 26, 2011. This work was supported by an appointment to the NASA Postdoctoral Program at the Goddard Space Flight Center administered by Oak Ridge Associated Universities through a contract with NASA.

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Digital Object Identifier 10.1109/TGRS.2010.2091139

## I. INTRODUCTION

SOIL MOISTURE (SM) is recognized as an important component of the water, energy, and carbon cycles at the interface between the Earth's surface and atmosphere, yet it is difficult to measure globally using traditional *in situ* techniques. Several planned microwave space missions, most notably the European Space Agency's Soil Moisture and Ocean Salinity (SMOS) mission (launched in November 2009) and NASA's Soil Moisture Active and Passive (SMAP) mission (to be launched in 2014/2015), are focusing on obtaining accurate SM information over as much of the Earth's land surface as possible [1], [2]. However, current baseline retrieval algorithms for SMOS and candidate retrieval algorithms for SMAP are based on an easily implemented but theoretically simple zero-order radiative transfer (RT) approach called the  $\tau-\omega$  (tau-omega) model [3]. The model includes components from the soil and vegetation, but vegetation scattering is not represented properly. This approach essentially places a limit on the density of the vegetation through which SM can be accurately retrieved.

Both SMOS and SMAP have mission requirements to retrieve volumetric SM (VSM) to an accuracy of  $0.04 \text{ cm}^3 \cdot \text{cm}^{-3}$  through vegetation water content (VWC) of  $5 \text{ kg} \cdot \text{m}^{-2}$ . These missions are expected to meet their requirement for SM retrieval accuracy using the heritage  $\tau-\omega$  model approach over approximately 65% of the Earth's land surface where the VWC does not exceed  $5 \text{ kg} \cdot \text{m}^{-2}$ . As the density of vegetation increases, sensitivity to the underlying SM begins to degrade significantly, and errors in the retrieved SM increase accordingly. The zero-order  $\tau-\omega$  model also loses its validity when dense vegetation (i.e., forest, mature corn, etc.) includes scatterers, such as branches and trunks (or stalks in the case of corn), which are large with respect to the wavelength. Thus, knowledge of vegetation features at L-band (1–2 GHz) appears to be of great importance in order to optimally utilize microwave radiometric data in SM retrievals over vegetated landscapes. The purpose of this paper is to develop a first-order model that takes into account vegetation scattering more accurately and that allows us to perform a physical analysis of the scattered and emitted radiation from vegetated terrain.

In the presence of vegetation, the emission from soil is attenuated and scattered by the vegetation, while the vegetation contributes its own emission. The question of how to separate the soil component from radiometer data collected over vegetated landscapes has been the subject of many papers

[3]–[18]. In order to understand and interpret measured data, several theoretical emission models have been developed and successfully validated in many cases [5]–[8]. The common approach to simulate the brightness temperature of vegetation is the RT theory [19]–[22], which can treat single and multiple scattering in a medium consisting of random discrete scatterers uniformly located in the vegetation layer. The theory assumes independent scattering and then disregards coherent effects.

A model based on the RT theory and the matrix-doubling algorithm was implemented by Ferrazzoli and Guerriero [7] and validated with experimental data. It considers the multiple-scattering effects of the volume scattering and the interactions between layers in the vegetation canopy and the underlying ground surface. The various contributions are combined by means of the matrix-doubling algorithm [21] to yield the bistatic scattering coefficient of a forest canopy. The latter was finally used to simulate the emissivity, through the energy conservation law.

A physical model for vegetation canopies that generalizes the restrictions imposed by earlier models with regard to the canopy type, temperature profile, and sky radiation was developed by Karam [8]. The vegetation is modeled as a multilayer random medium above a rough surface. This multilayer model is based on an iterative solution of the RT equations by using albedo as a perturbation (small) parameter, and the brightness temperature is expanded in a power series in albedo. Explicit expressions for zero- and first-order solutions of the albedo expansion are obtained. The model was validated with experimental data acquired over corn and soybean crops and also used to simulate emission from a walnut canopy. The first-order solution in albedo is also shown to be equivalent to Peake's emissivity formula [23] for canopies having uniform physical temperature profiles [8].

The Peake's emissivity formula in conjunction with a single-scattering approximation [24], which is called distorted born approximation (DBA), was implemented by Saatchi *et al.* [5] and Chauhan *et al.* [6] for a variety of land covers such as grass and corn. The procedure for calculation of vegetation emission is accomplished by first calculating the bistatic scattering cross section for each type of scatterer and then using the DBA to calculate the specular albedo of the ground and the diffused albedo consisting of the scattering from the vegetation layer and the surface roughness. Once the albedos are determined, Peake's principle relating active and passive problems is used to determine the effective emissivity of the vegetation layer.

In this paper, a microwave radiometry model that considers first-order scattering at L-band will be developed and validated against experimental data. The model assumes that the vegetation canopy has a uniform temperature and the soil surface may be rough. It is based on an iterative solution of the RT equations by interpreting the scattering source function as a perturbation to the nonscattering RT equations. This perturbation technique is known as the method of "successive orders of scattering" [25], [26]. The results are substantially simplified at L-band by taking the first two terms of the expansion of the transport result. It provides explicit expression for first-order scattering and emission processes that occur within the canopy. This formulation adds a new scattering term to the  $\tau$ - $\omega$  model (the

zero-order RT solution). The additional term represents single scattered radiation by particles in the vegetation layer due to the emission generated by the ground and the particles in the vegetation layer. The resulting model represents an improvement over the standard zero-order solution since it accounts for the scattered vegetation and ground radiation that can have a pronounced effect on the observed emission and subsequent SM retrieval.

In Section II of this paper, the problem of RT through a discrete sparse medium is formulated by means of an iterative approach. In Section III, explicit expressions for zero- and first-order solutions of the successive orders of scattering expansion are obtained, and scattering properties of tree stands are also discussed. In Section IV, descriptions of instrumentation and the field experiment along with ground-truth data are given. In Section V, the zero- and first-order scattering solutions are compared with microwave brightness temperature data acquired over deciduous tree canopies in Maryland during 2007. Contributions of the individual scattering terms to the tree scattering are demonstrated. Significant terms contributing to forest scattering are identified, and their dependence on incidence angle and SM is demonstrated. Finally, Section VI summarizes the work presented in this paper.

## II. BASIC PROBLEM FORMULATION

The starting point for microwave remote sensing of SM through vegetation is often classical RT theory. The RT approach is a heuristic method based on the law of energy conservation. The RT approach starts with the RT equation that governs the transport of specific intensity through a scattering medium. Due to the independent scattering assumption, RT is inherently an incoherent theory; therefore, it supplies no phase information and neglects any coherence effect. Because of its simple and intuitive nature, the RT approach has found widespread use in problems of passive microwave remote sensing of SM under vegetation. Most microwave SM retrieval algorithms developed for use at low microwave frequencies such as L-band or 1.4 GHz are based on a zero-order RT approach usually referred to as the  $\tau$ - $\omega$  model, where vegetation effects are parameterized by tau (the vegetation opacity) and omega (the single-scattering albedo).

As previously mentioned, the applicability of the  $\tau$ - $\omega$  model to areas with a significant tree fraction is unknown, particularly given its neglect of large scattering effects. It is likely that this approach will need modification (in terms of form or effective parameterization) to more accurately account for canopy scattering. The fundamentals of the RT theory offer one possibility on how to modify the  $\tau$ - $\omega$  model. The tree canopy can be envisioned as a random collection of discrete scatterers. Assuming that the average phase functions of tree components are known, together with their average forward-scattering cross sections, the RT equations can be formulated. The RT equations can then be solved iteratively up to the first-order scattering for a tree canopy since L-band is sufficiently low frequency and only single scattering will be important.

Fig. 1 shows an illustration of the forest model that will be employed here. The forested terrain is considered as a random

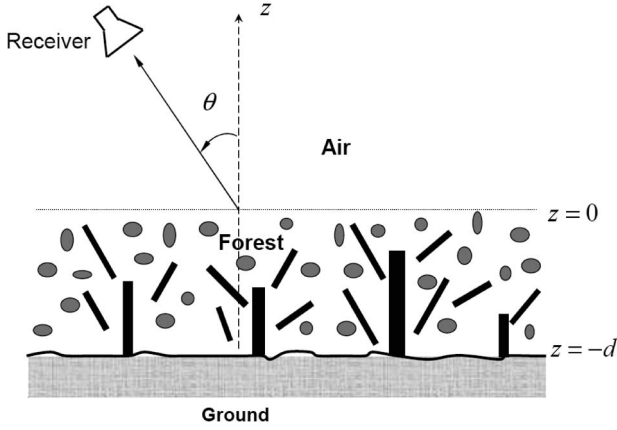


Fig. 1. Emission from a forest canopy over a rough ground.

medium of discrete lossy dielectric particles that are uniformly distributed between a ground plane at  $z = -d$  and a diffuse upper boundary at  $z = 0$ , where  $d$  is the canopy layer thickness. The canopy is assumed to be over a homogenous dielectric half-space with a relative dielectric constant  $\varepsilon_g$ , representing the ground, and the interface between the ground and canopy is allowed to be rough. The vegetation layer will be represented as an ensemble of discrete scatterers with their orientation, size, and position statistics in a free-space background. It is assumed that scatterers of different kinds are uniformly located within the vegetation layer. The vegetation components have canonical shapes. The leaves are modeled as thin dielectric disks [27], [28]. Branches and trunks are modeled as finite-length dielectric cylinders of commensurate dimensions [29], [30]. The single-scattering characteristics of these constituents when averaged determine the attenuation and scattering properties of the canopy. The advantage of the discrete approach is that the results are expressed in terms of quantities (plant geometry and orientation statistics) that are related to the biophysical properties of individual plants.

For most of the vegetated terrain, it can be assumed that the orientation statistics for all scatterers are invariant in the azimuth coordinates. The specific intensity is thus only a function of the observation angle  $\theta$ , and the solutions of RT equations are greatly simplified. It can also be shown that the third and fourth Stokes parameters are zero due to azimuthal rotational symmetry [20]. As a result, the vector transport equations can be written as two scalar equations, one for each polarization. The RT equations for up- and downwelling intensities are given, respectively, by

$$\cos \theta \frac{d}{dz} I_p(\theta, z) = -\kappa_{ep}(\theta) I_p(\theta, z) + \kappa_{ap}(\theta) C T_v + S_p(\theta, z) \quad (1.a)$$

$$\begin{aligned} -\cos \theta \frac{d}{dz} I_p(\pi - \theta, z) &= -\kappa_{ep}(\pi - \theta) I_p(\pi - \theta, z) \\ &+ \kappa_{ap}(\pi - \theta) C T_v + S_p(\pi - \theta, z) \end{aligned} \quad (1.b)$$

where  $I_p(\theta, z)$  and  $I_p(\pi - \theta, z)$  are the upward and downward Stokes intensities for  $0 \leq \theta \leq \pi/2$ , respectively, including both

vertical (v) and horizontal (h) polarizations, i.e.,  $p \in \{h, v\}$ . The quantities  $\kappa_{ep}(\theta)$  and  $\kappa_{ap}(\theta)$  are the volume extinction and absorption coefficients, respectively, for polarization  $p$ . The first term at the right-hand side of (1.a) and (1.b) is due to the loss in the layer, and the second term represents the thermal emission contribution by the layer, which is equated to the radiation absorbed by the layer assuming local thermal equilibrium. The ambient temperature of the canopy is assumed to be uniform and is given by  $T_v$ . The constant  $C$  is given by  $C = K/\lambda_0^2$ , where  $K$  is the Boltzmann constant and  $\lambda_0$  is the free-space wavelength.

The emitted radiations experience the same amount of attenuation within the vegetation irrespective of whether they travel in the angle of  $\theta$  direction or the angle of  $\pi - \theta$  direction. This is due to the reciprocity property of the particles and the azimuthal invariance to the particle rotation. As a result of these symmetries, the following notations will be employed:  $\kappa_{ep}(\theta) = \kappa_{ep}(\pi - \theta)$  and  $\kappa_{ap}(\theta) = \kappa_{ap}(\pi - \theta)$ . By means of the forward-scattering theorem, the average vegetation extinction coefficient can be written as

$$\kappa_{ep}(\theta) = \frac{4\pi}{k_0} \sum_{\alpha} \rho_{\alpha} \text{Im} \left\{ \left\langle f_{fpp}^{(\alpha)} \right\rangle \right\} \quad (1.c)$$

where the number density of the scatterer type  $\alpha$  is given by  $\rho_{\alpha}$  and  $k_0$  is the wavenumber, i.e.,  $k_0 = 2\pi f_0/c$ , with  $f_0$  being the frequency and  $c$  being the speed of propagation in free space. The angular brackets in this formula denote ensemble average over the angular and size statistics of particles. The leaves are represented by an average-size circular disk; hence, the averaging is done for orientation angles only. The trunks are vertical and have a typical size. No averaging is therefore performed on trunks. The branch data are divided into several groups, and each group has an average length and an average diameter. Orientation averaging is then performed on each branch group. Notice that, in this formula,  $f_{fpp}^{(\alpha)}$  is the forward-scattering amplitude of the  $\alpha$ th group of scatterers.

The last term at the right-hand side of (1.a) and (1.b) represents the scattering contribution by the layer. The upward and downward scattering source functions  $S_p(\theta, z)$  and  $S_p(\pi - \theta, z)$  couple the equations for h- and v-polarized intensities as well as upward and downward radiations, and they are given by

$$\begin{aligned} S_p(\theta, z) &= \int_{2\pi} d\Omega' \sum_{q=h,v} \{ F_{pq}(\theta, \phi; \theta', \phi') I_q(\theta', z) \\ &+ F_{pq}(\theta, \phi; \pi - \theta', \phi') I_q(\pi - \theta', z) \} \end{aligned} \quad (1.d)$$

where the polarizations  $p$  and  $q$  can be horizontal (h) or vertical (v) and the summation over  $q$  accounts for the possible polarization combinations. A similar expression for  $S_p(\pi - \theta, z)$  can also be written by replacing  $\theta$  with  $\pi - \theta$  in (1.d). The integration in (1.d) is performed over  $2\pi$  in the upper hemisphere, where  $d\Omega' = d\phi' d\theta' \sin \theta'$ . The collective phase function per unit volume is given by

$$F_{pq}(\theta, \phi; \theta', \phi') = \sum_{\alpha} \rho_{\alpha} \left\langle \left| f_{pq}^{(\alpha)}(\theta, \phi; \theta', \phi') \right|^2 \right\rangle \quad (1.e)$$

where the quantity  $f_{pq}^{(\alpha)}(\theta, \phi; \theta', \phi')$  is the bistatic scattering amplitude of the  $\alpha$ th group of scatterers. This function describes the scattering properties from direction  $(\theta', \phi')$  into direction  $(\theta, \phi)$ .

The differential RT equations given in (1.a) and (1.b) will next be converted into integral equations. First, multiplying (1.a) by  $e^{\kappa_{ep}(\theta)z \sec \theta}$  and integrating this from  $-d$  to  $z$  give

$$I_p(\theta, z) = e^{-\kappa_{ep}(\theta)(z+d) \sec \theta} I_p(\theta, -d) + CT_v \left[ 1 - e^{-\kappa_{ep}(\theta)(d+z) \sec \theta} \right] [1 - \omega_p(\theta)] + \sec \theta \int_{-d}^z dz' e^{\kappa_{ep}(\theta)(z'-z) \sec \theta} S_p(\theta, z'). \quad (2.a)$$

Similarly, multiplying (1.b) by  $e^{-\kappa_{ep}(\theta)z \sec \theta}$  and integrating this from  $z$  to zero give

$$I_p(\pi - \theta, z) = e^{\kappa_{ep}(\theta)z \sec \theta} I_p(\pi - \theta, 0) + CT_v \left[ 1 - e^{\kappa_{ep}(\theta)z \sec \theta} \right] [1 - \omega_p(\theta)] + \sec \theta \int_z^0 dz' e^{-\kappa_{ep}(\theta)(z'-z) \sec \theta} S_p(\pi - \theta, z') \quad (2.b)$$

where the above formulas are written in terms of the composite scattering albedo, which is denoted by  $\omega_p(\theta)$ , by employing energy conservation. This is the albedo of the average scatterer in the canopy. It represents the fractional power scattered from the average particle. The composite scattering albedo is given by [20]

$$\omega_p(\theta) = 1 - \frac{\kappa_{ap}(\theta)}{\kappa_{ep}(\theta)} = \int_{4\pi} d\Omega' \sum_{q=h,v} F_{pq}(\theta, \phi; \theta', \phi') / \kappa_{ep}(\theta). \quad (2.c)$$

To cast the integral equations (2.a) and (2.b) into a form suitable for iterative solution, the applicable boundary conditions will be incorporated into these equations from which the zero- and first-order solutions are driven. The vegetation upper boundary is assumed to be diffuse, and there is no radiation (from the upper atmosphere and cosmic background) going into the vegetation layer, i.e., at  $z = 0$

$$I_p(\pi - \theta, 0) = 0. \quad (3.a)$$

At the soil surface ( $z = -d$ ), part of the downwelling radiation is reflected by the surface, while the ground contributes its own emission. The upward emission at the ground surface is given by

$$I_p(\theta, -d) = R_{gp}(\theta) I_p(\pi - \theta, -d) + [1 - R_{gp}(\theta)] CT_g \quad (3.b)$$

where  $R_{gp}$  and  $T_g$  are the ground reflectivity and ground temperature, respectively. The tree site considered in this paper (refer to Section IV-B) is composed of planted Paulownia trees, and the ground under trees was relatively smooth. The surface *rms* height was on the order of 0.5–1 cm, which was rather

low compared to the wavelength at L-band. As a result, only coherent component of the roughness is important for this study, and diffuse component is neglected. It is also assumed that the rough surface under the forest follows Kirchhoff's approximation and has a Gaussian height distribution [31]; therefore, the reflectivity of the rough surface is expressed as

$$R_{gp}(\theta) = \Gamma_{gp}(\theta) e^{-h \cos^2 \theta}, \quad p \in \{h, v\} \quad (3.c)$$

where  $\Gamma_{gp}(\theta)$  is the  $p$ -polarized Fresnel reflectivity of the average dielectric surface and the roughness height parameter is given by  $h = 4\sigma^2 k_0^2$ , with  $\sigma$  being the surface *rms* height. In addition to roughness, one should also consider moist litter present on most of natural forest floors, which could alter surface reflectivity significantly as verified by recent theoretical and experimental studies [32]–[34]. In this paper, the litter layer will not be considered since the experiment site under investigation did not have litter layer.

Substituting the boundary condition (3.a) in (2.b), the downwelling intensity at  $z$  within the vegetation layer is found as

$$I_p(\pi - \theta, z) = CT_v \left[ 1 - e^{\kappa_{ep}(\theta)z \sec \theta} \right] [1 - \omega_p(\theta)] + \sec \theta \int_z^0 dz' e^{-\kappa_{ep}(\theta)(z'-z) \sec \theta} S_p(\pi - \theta, z') \quad (4.a)$$

and substituting (4.a), evaluated at  $z = -d$ , into (2.a) with the second boundary condition (3.b) yields the upwelling intensity at  $z$  within the vegetation layer as

$$I_p(\theta, z) = CT_v \left[ 1 - e^{-\kappa_{ep}(\theta)(z+d) \sec \theta} \right] [1 - \omega_p(\theta)] + CT_v e^{-\kappa_{ep}(\theta)(z+d) \sec \theta} R_{gp}(\theta) \times \left[ 1 - e^{-\kappa_{ep}(\theta)d \sec \theta} \right] [1 - \omega_p(\theta)] + CT_g e^{-\kappa_{ep}(\theta)(z+d) \sec \theta} [1 - R_{gp}(\theta)] + \sec \theta \int_{-d}^z dz' e^{\kappa_{ep}(\theta)(z'-z) \sec \theta} S_p(\theta, z') + \sec \theta e^{-\kappa_{ep}(\theta)(z+d) \sec \theta} R_{gp}(\theta) \times \int_{-d}^0 dz' e^{-\kappa_{ep}(\theta)(z'+d) \sec \theta} S_p(\pi - \theta, z'). \quad (4.b)$$

Equations (4.a) and (4.b) are the starting equations for iteration. The objective of the problem is to solve for upward propagating intensity at  $z = 0$  iteratively and then transmit it into the medium above the canopy layer.

### III. SUCCESSIVE ORDERS OF SCATTERING

Iterative techniques to solve RT equations have been extensively applied to microwave remote sensing of the Earth for more than three decades. The classic books of this subject include those of Ishimaru [19], Tsang *et al.* [20], Ulaby *et al.* [21],



and Fung [22], in addition to Karam's article [8] published in 1997. Iterative solutions of RT equations are described for active and/or passive problems of random medium. The volume scattering coefficient is usually considered small in these works, and as a result, the first-order solutions for active and/or passive problems refer to a first-order solution in volume scattering coefficient.

In this section, a similar approach with a different choice of small parameter is adapted to compute forest emission. Basically, the scattering source function [given in (1.d)] is interpreted as a perturbation to the nonscattering RT equations as oppose to volume scattering coefficient. This perturbation technique is known as the method of "successive orders of scattering" [25], [26]. In this technique, the brightness temperature is expanded into a series in terms of scattering mechanisms and substituted in RT equations. Then, collecting terms to the same order, the resulting RT equations are solved sequentially to the higher orders. The procedure is as follows: The zero-order RT solution is found by solving the nonscattering RT equations. The first-order solution of the RT equation with respect to the scattering source function is obtained by using the zero-order RT brightness temperature as an exciting source. The first-order solution is then substituted in the RT equations, and the second-order solution is obtained. This process is repeated to obtain higher order solutions which capture higher order scattering processes. Higher order scattering terms are usually not considered at L-band, and the results are substantially simplified at L-band by taking only the first two terms of the expansion of the transport result.

#### A. Zero-Order Solution (the $\tau$ - $\omega$ Model)

The zero-order solution represents the solution to the non-scattering RT equations, where scattering is largely ignored by setting the scattering source functions  $S_p(\theta, z')$  and  $S_p(\pi - \theta, z')$  in (4.a) and (4.b) to zero. In this approximation, the vegetation canopy is treated as an effective attenuating layer, and the resulting equations for the up- and downwelling intensities can be obtained as

$$\begin{aligned} I_p^{(0)}(\theta, z) &= CT_v \left[ 1 - e^{-\kappa_{ep}(\theta)(z+d) \sec \theta} \right] [1 - \omega_p(\theta)] \\ &\quad + CT_v e^{-\kappa_{ep}(\theta)(z+d) \sec \theta} R_{gp}(\theta) \\ &\quad \times \left[ 1 - e^{+\kappa_{ep}(\theta)d \sec \theta} \right] [1 - \omega_p(\theta)] \\ &\quad + CT_g e^{-\kappa_{ep}(\theta)(z+d) \sec \theta} [1 - R_{gp}(\theta)] \end{aligned} \quad (5.a)$$

$$I_p^{(0)}(\pi - \theta, z) = CT_v \left[ 1 - e^{+\kappa_{ep}(\theta)z \sec \theta} \right] [1 - \omega_p(\theta)]. \quad (5.b)$$

By using the relation between brightness temperature and intensity, i.e.,  $T_{Bp}(\theta, z) = I_p(\theta, z)/C$ , the brightness temperature observed above the canopy (at  $z \geq 0$ ) can be written as

$$\begin{aligned} T_{Bp}^{(0)}(\theta) &= [1 - \gamma_p(\theta)] [1 - \omega_p(\theta)] T_v \\ &\quad + \gamma_p(\theta) R_{gp}(\theta) [1 - \gamma_p(\theta)] [1 - \omega_p(\theta)] T_v \\ &\quad + \gamma_p(\theta) [1 - R_{gp}(\theta)] T_g. \end{aligned} \quad (6.a)$$

Here,  $T_{Bp}^{(0)}(\theta)$  is the zero-order RT brightness temperature observed above the vegetation,  $R_{gp}$  is the microwave reflectivity given in (3.c),  $T_v$  and  $T_g$  are the physical temperatures of the vegetation and soil,  $\omega_p(\theta)$  is the composite scattering albedo given in (2.c), and  $\gamma_p(\theta)$  is the vegetation transmissivity which is parameterized as (Beer's law)

$$\gamma_p(\theta) = e^{-\tau_p(\theta) \sec \theta} \quad (6.b)$$

where  $\tau_p(\theta) = \kappa_{ep}(\theta)d$  is the vegetation opacity or optical thickness and  $\theta$  is the observation angle from nadir.

Equation (6.a) is known in the SM community as the  $\tau$ - $\omega$  model [3]. Each term represents upwelling emission from the layer, downwelling emission from the layer reflected from the ground, and ground surface emission attenuated by the vegetation layer, respectively. The effect of scattering on this solution can be seen easily by assuming that vegetation and ground temperature is the ambient temperature and regrouping (6.a) in terms of albedo as

$$\begin{aligned} e_p^{(0)}(\theta) &= T_{Bp}^{(0)}(\theta)/T_v \\ &= [1 - \gamma_p^2(\theta) R_{gp}(\theta)] - \omega_p(\theta) [1 + \gamma_p(\theta) R_{gp}(\theta)] \\ &\quad \times [1 - \gamma_p(\theta)] \end{aligned} \quad (7)$$

where the first term represents the no scattering solution (independent of scattering albedo) and is also equivalent to the zero-order solution of the albedo expansion for canopies having uniform physical temperature profiles [8], [9].

Often, the albedo has been assumed to be either zero or small under the assumption that the scattering contribution of low vegetation such as grasslands and many agricultural crops is negligible. Researchers have sometimes further simplified the  $\tau$ - $\omega$  model by setting albedo to zero and used the first term in (7) for SM retrieval under vegetation [4].

It should also be noted that the presence of scattering [the second term in (7)] induces darkening in the zero-order solution since scattering hinders the emission from reaching an observing radiometer. To investigate the effect of the albedos of the individual tree constituents (branches, trunks, and leaves) on the zero-order solution, the scattering albedos of the deciduous Paulownia tree components are calculated and plotted in Fig. 2. The tree characteristics given in Table I of Section IV-B are used to generate these plots. The left column of the figure shows the angular and polarization dependence of the single-scattering albedos for branches, trunks, and leaves from top to bottom, respectively. In the second column, the branch contribution, the branch and trunk collective contributions, and the contributions of all of the tree constituents to the albedo are plotted in finer scale from top to bottom, respectively. From these plots, the following are shown: 1) The trunk albedo is highly angular and polarization dependent; 2) the leaves have the lowest albedo; and 3) the branches are the dominant constituents that determine the composite scattering albedo. These results are in agreement with theoretical findings [35] and also in agreement with experimental observations [15].

The values of the branch albedos for both polarizations are within the range of 0.5–0.6. This large albedo of a tree canopy

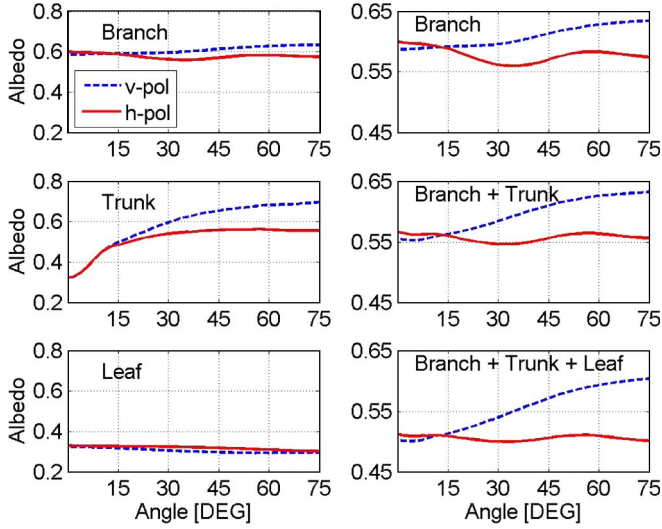


Fig. 2. Angular and polarization dependences of the individual and composite scattering albedos. The tree characteristics are provided in Table I of Section IV-B.

causes scatter-induced reduction in brightness temperature, and this scattering darkening effect for vegetation canopies (with large scatterers) should be balanced with a scattering contribution which is missing in (7). One solution to this problem is to adapt the formula given in (7) for forests with effective vegetation parameters  $\tau$  and  $\omega$  by fitting the experimental data or simulation outputs of a multiple-scattering model [35]. The effective albedo will not be the albedo of single forest elements anymore, but it becomes a global parameter, which depends on all the processes taking place within the canopy, including multiple scattering. In this paper, a different approach is applied to correct this scattering contribution to the zero-order solution by adding an extra term to (7), which will represent the first-order scattering term.

### B. First-Order Solution

The term first order refers to a first-order scattering in scattering source function. The solution represents the single-scattering solution, i.e., the radiated emission from the layer or ground is scattered once by a scatterer. To find the first-order solution, RT equations need to be solved for upwelling intensity  $I_p(\theta, z)$ , and the solution will be evaluated at  $z = 0$ . The first-order specific intensity at the vegetation upper boundary is given by

$$I_p^{(1)}(\theta, 0) = I_p^{(0)}(\theta, 0) + \sec \theta \int_{-d}^0 dz' e^{\kappa_{ep}(\theta) z'} \sec \theta S_p^{(0)}(\theta, z') + \sec \theta e^{-\kappa_{ep}(\theta) d} \sec \theta R_{gp}(\theta) \times \int_{-d}^0 dz' e^{-\kappa_{ep}(\theta)(z'+d)} \sec \theta S_p^{(0)}(\pi - \theta, z') \quad (8)$$

where  $S_p^{(0)}(\theta, z')$  and  $S_p^{(0)}(\pi - \theta, z')$  represent the upward and downward scattering source functions, respectively, due

to the zero-order emission. These quantities are obtained by substituting the zero-order scattering solutions (5.a) and (5.b) into the scattering source function given in (1.d). Carrying out the integrations in (8) over the canopy layer depth yields the following emissivity formulation:

$$e_p^{(1)}(\theta) = T_{Bp}^{(1)}(\theta)/T_v = e_p^{(0)}(\theta) + \Omega_p(\theta) \quad (9.a)$$

where the ambient temperatures of the vegetation layer and the ground are assumed to be the same,  $e_p^{(0)}(\theta)$  is the zero-order solution as given in (7), and the parameter  $\Omega_p(\theta)$  denotes the additional scattering term to the zero-order model, which represents the emission from the ground and the vegetation layer that is single scattered from tree trunks, branches, and leaves/needles in the case of forests and from thick stalks and leaves in the case of agricultural crops like corn. The scattering component  $\Omega_p(\theta)$  is composed of eight terms representing different scattering mechanisms which are given by

$$\Omega_p(\theta) = \sum_j \left\{ \Omega_{jp}^{(s1)}(\theta) + \Omega_{jp}^{(sr1)}(\theta) \right\}, \quad \text{where } j \in \{G, U, D, DG\} \quad (9.b)$$

where the summation index  $j$  denotes the scattering-mechanism types, i.e., the subscripts  $G$ ,  $U$ ,  $D$ , and  $DG$  refer to the scattered radiation contributions due to ground emission, upwelling emission, downwelling emission, and downwelling emission followed by ground reflection, respectively. The processes of scattering are shown in Fig. 3. The scattered radiation from each mechanism arrives at the receiver either directly (denoted by  $s1$ ) or through reflection from the ground (denoted by  $sr1$ ) as shown in this figure. The explicit expressions for each scattering term are as follows.

1) *Scattered Ground Emission*: This term represents the ground emission that is scattered once from a particle in the layer as shown in Fig. 3(a). The scattered radiation arrives at the receiver either directly or through reflection from ground, and both received signals are given, respectively, by

$$\Omega_{Gp}^{(s1)}(\theta) = \sec \theta \int_{2\pi} d\Omega' \sum_{q=h,v} F_{pq}(\theta, \phi; \theta', \phi') A_{1pq}(\theta, \theta') \times [1 - R_{gq}(\theta')] \quad (10.a)$$

$$\Omega_{Gp}^{(sr1)}(\theta) = \sec \theta R_{gp}(\theta) \gamma_p(\theta) \times \int_{2\pi} d\Omega' \sum_{q=h,v} F_{pq}(\pi - \theta, \phi; \theta', \phi') \times A_{2pq}(\theta, \theta') [1 - R_{gq}(\theta')] \quad (10.b)$$

where the summation over  $q$  accounts for the possible polarization combinations and the integration over  $d\Omega'$  accounts for all possible emitted radiation directions through which the emitted signal is scattered from the vegetation layer and propagates toward the receiver. The phase function  $F_{pq}(\theta, \phi; \theta', \phi')$  is defined in (1.e), and it represents collective scattering from a unit volume within the vegetation layer. The quantities  $A_{1pq}(\theta, \theta')$  and  $A_{2pq}(\theta, \theta')$  in (10.a) and (10.b) are the result of the

TABLE 1  
CANOPY PARAMETERS FROM DESTRUCTIVE SAMPLING

TREE COMPONENTS	PARAMETERS				
	AVERAGE LENGTH [cm]	AVERAGE RADIUS [cm]	DENSITY [m <sup>-3</sup> ]	DIELECTRIC CONSTANT	ORIENTATION
TRUNKS	617.0	8.73	0.005	15.6+i3.8	Vertical
PRIMARY BRANCHES	187.0	4.30	0.016	12.0+i2.9	Uniform [20°–50°]
	153.8	1.58	0.188	12.0+i2.9	Uniform [10°–60°]
SECONDARY BRANCHES	63.6	0.98	0.734	12.0+i2.9	Uniform [0°–90°]
	48.1	0.45	1.933	12.0+i2.9	Uniform [0°–90°]
LEAVES	(AV. THICKNESS) 0.012	10.2	11.12	35.2+i5.3	Uniform [0°–90°]

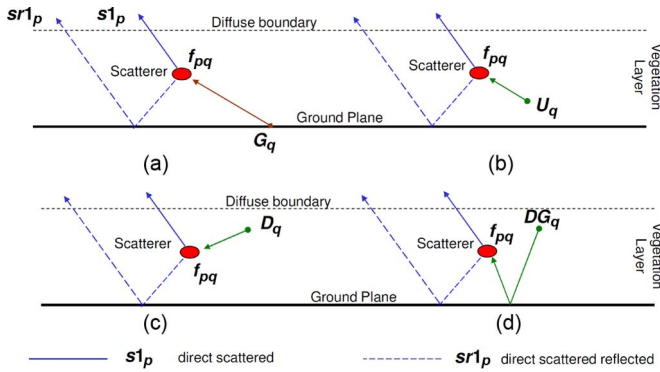


Fig. 3. First-order scattering mechanisms: (a) Scattered ground emission, (b) scattered upward emission from the vegetation layer, (c) scattered downward emission from the vegetation layer, and (d) scattered reflected-downward emission from the vegetation layer.

integration of the loss factors  $e^{\kappa_{ep}(\theta)z \sec \theta}$  and  $e^{\kappa_{eq}(\theta')z \sec \theta'}$  in various combinations associated with the unit volume located at  $z$  over the vegetation layer depth. These quantities are given by

$$A_{1pq}(\theta, \theta') = \frac{\gamma_q(\theta') - \gamma_p(\theta)}{\kappa_{ep}(\theta) \sec \theta - \kappa_{eq}(\theta') \sec \theta'} \quad (10.c)$$

$$A_{2pq}(\theta, \theta') = \frac{1 - \gamma_p(\theta)\gamma_q(\theta')}{\kappa_{ep}(\theta) \sec \theta + \kappa_{eq}(\theta') \sec \theta'} \quad (10.d)$$

where the volume vegetation extinction coefficient  $\kappa_{ep}(\theta)$  and transmissivity  $\gamma_p(\theta)$  are defined in (1.c) and (6.b), respectively.

2) *Scattered Upward Emission From the Vegetation Layer:* This term represents the upwelling emission that is scattered once from a particle in the layer as shown in Fig. 3(b). The scattered radiation arrives at the receiver either directly or through reflection from the ground, and both received signals are given, respectively, by

$$\Omega_{Up}^{(s1)}(\theta) = \sec \theta \int_{2\pi} d\Omega' \sum_{q=h,v} F_{pq}(\theta, \phi; \theta', \phi') \times [A_{3p}(\theta) - A_{1pq}(\theta, \theta')] [1 - \omega_q(\theta')] \quad (11.a)$$

$$\Omega_{Up}^{(sr1)}(\theta) = \sec \theta R_{gp}(\theta) \gamma_p(\theta) \int_{2\pi} d\Omega' \sum_{q=h,v} F_{pq}(\pi - \theta, \phi; \theta', \phi') \times [A_{3p}(\theta) - A_{2pq}(\theta, \theta')] [1 - \omega_q(\theta')] \quad (11.b)$$

where the quantity  $A_{3p}(\theta)$  is the result of the integration of the loss factors  $e^{\kappa_{ep}(\theta)z \sec \theta}$ , associated with a unit volume located at  $z$  over the vegetation layer depth. This is given by

$$A_{3p}(\theta) = \frac{1 - \gamma_p(\theta)}{\kappa_{ep}(\theta) \sec \theta}. \quad (11.c)$$

3) *Scattered Downward Emission From the Vegetation Layer:* This term represents the downwelling emission that is scattered once from a particle in the layer as shown in Fig. 3(c). The scattered radiation arrives at the receiver either directly or through reflection from the ground, and both received signals are given, respectively, by

$$\Omega_{Dp}^{(s1)}(\theta) = \sec \theta \int_{2\pi} d\Omega' \sum_{q=h,v} F_{pq}(\theta, \phi; \pi - \theta', \phi') \times [A_{3p}(\theta) - A_{2pq}(\theta, \theta')] [1 - \omega_q(\theta')] \quad (12.a)$$

$$\Omega_{Dp}^{(sr1)}(\theta) = \sec \theta R_{gp}(\theta) \gamma_p(\theta) \int_{2\pi} d\Omega' \sum_{q=h,v} F_{pq}(\pi - \theta, \phi; \pi - \theta', \phi') \times [A_{3p}(\theta) - A_{1pq}(\theta, \theta')] [1 - \omega_q(\theta')]. \quad (12.b)$$

4) *Scattered Reflected-Downward Emission From the Vegetation Layer:* This term represents the downwelling emission that is reflected from the ground and is followed by scattering once from a particle in the layer as shown in Fig. 3(d). The scattered radiation arrives at the receiver either directly or through reflection from the ground, and both received signals are given, respectively, by

$$\Omega_{DGp}^{(s1)}(\theta) = \sec \theta \int_{2\pi} d\Omega' \sum_{q=h,v} F_{pq}(\theta, \phi; \theta', \phi') A_{1pq}(\theta, \theta') \times R_{gq}(\theta') [1 - \gamma_q(\theta')] [1 - \omega_q(\theta')] \quad (13.a)$$

$$\Omega_{DGp}^{(sr1)}(\theta) = \sec \theta R_{gp}(\theta) \gamma_p(\theta) \int_{2\pi} d\Omega' \sum_{q=h,v} F_{pq}(\pi - \theta, \phi; \theta', \phi') \times A_{2pq}(\theta, \theta') R_{gq}(\theta') [1 - \gamma_q(\theta')] [1 - \omega_q(\theta')]. \quad (13.b)$$





Fig. 4. ComRAD microwave instrument system deployed over a stand of Paulownia trees.

#### IV. INSTRUMENTATION AND EXPERIMENT

In this section, the experiment, along with the site information and the microwave instrument system used during the experiment, will be described. First, the ComRAD microwave active/passive instrument system is introduced with more emphasis on its L-band radiometer since this paper is concerned with passive data only. Then, the deciduous canopy and the associated ground truth are described.

##### A. Combined Radar/Radiometer System

The microwave instrument system used in this study is an outgrowth of a network-analyzer-based L-, C-, and X-band polarimetric radar system developed jointly by the NASA Goddard Space Flight Center and the George Washington University. The system is mounted on a 19-m hydraulic boom truck and has provided reliable calibrated radar data in SM field campaigns across the U.S. since the early 1990s. The truck system has been upgraded with the addition of a dual-polarized 1.4-GHz total power radiometer and is called ComRAD for combined radar/radiometer [36]. A novel broadband stacked-patch dual-polarized feed resonates at both the 1.4-GHz radiometer and 1.25-GHz radar frequencies, enabling both the L-band radar and radiometer to share the same 1.22-m parabolic dish antenna with 3-dB beamwidth of approximately  $12^\circ$ . The main purpose of this system is to provide microwave data for verifying the applicability of active and passive instruments in a combined manner for predicting the microwave emission from soils. A photograph of the truck system taking measurements over deciduous Paulownia trees is shown in Fig. 4.

ComRAD's L-band radiometer is a total power radiometer with a two-point internal calibration. The absolute accuracy and the sensitivity of the instrument are of  $\pm 1$  K and of  $\pm 0.1$  K, respectively. For internal calibration, the cold source is implemented by an amplifier with an isolator attached to the input and terminated by a  $50\text{-}\Omega$  matched microwave load, and the hot source is made up of a commercial hot noise source along with an attenuator. At an internal physical temperature of  $45^\circ\text{C}$ , the reference hot sources are 401.2 K and 395.4 K for h- and v-polarized signals, respectively, and the cold sources are 154.5 K and 142.7 K for h- and v-polarized signals, respectively. The noise characteristics of the internal calibration sources were determined as a function of internal ambient temperature at the beginning of each field campaign. External calibration of the radiometer is carried out during each measurement run to correct the temperature variation and loss at the cables connecting the receiver and antenna. This external calibration is achieved using cold sky and ambient microwave absorber targets.

##### B. Experiment

In an effort to improve our understanding of the microwave properties of trees and their effect on SM retrieval algorithms, a coordinated sequence of field measurements involving the ComRAD active/passive microwave truck instrument system was initiated in late summer 2006. During fall 2006 (initial field checkout) and spring–fall 2007, ComRAD was deployed to a planted deciduous tree test site at an experimental farm run by the University of Maryland's Central Maryland Research and Education Center (CMREC) near Upper Marlboro, Maryland [37]. This paper will concentrate on the radiometer data collected in 2007 over stands of deciduous trees under no-leaf (April 10 and 25) and full-canopy conditions (May 18 and 24) as shown in Fig. 5. Supporting ground-truth data (including SM, ambient temperature, tree characteristics, etc.) were also collected during experiments. The total amounts of rainfall in the months of April and May for the Upper Marlboro region were 118.6 mm (above normal) and 27.2 mm (very dry, about half of normal), respectively, and the mean air temperatures were  $10.8^\circ\text{C}$  (below normal) and  $18.9^\circ\text{C}$  (well above normal), respectively. No precipitation occurred during any of the microwave measurements.

The site at CMREC consisted of plots of planted stands of deciduous Paulownia trees, a fast-growing deciduous tree with broad leaves. The tree plot used in this paper had 92 trees in a  $1089\text{-m}^2$  area. The dry biomass was about  $9\text{ kg/m}^2$ , while the woody volume and density were  $185.8\text{ m}^3/\text{ha}$  and  $477.6\text{ kg/m}^3$ , respectively. The diameter at breast height (DBH) ranged from 17 to 23 cm (average DBH = 19.4 cm). The tree heights were variable, on the order of 11–14 m (average height = 13 m). Radiometer data were acquired at the height of 19 m above the ground level with incidence angles of  $15^\circ$ ,  $25^\circ$ ,  $35^\circ$ , and  $45^\circ$  from nadir. The corresponding footprints on the ground at these angles were 16.5, 20.1, 27.4, and  $43.2\text{ m}^2$ , respectively. On experiment days, data were collected over a time span of about 2 h mostly during early morning. During the radiometer measurements, the truck boom was rotated in a conical scan



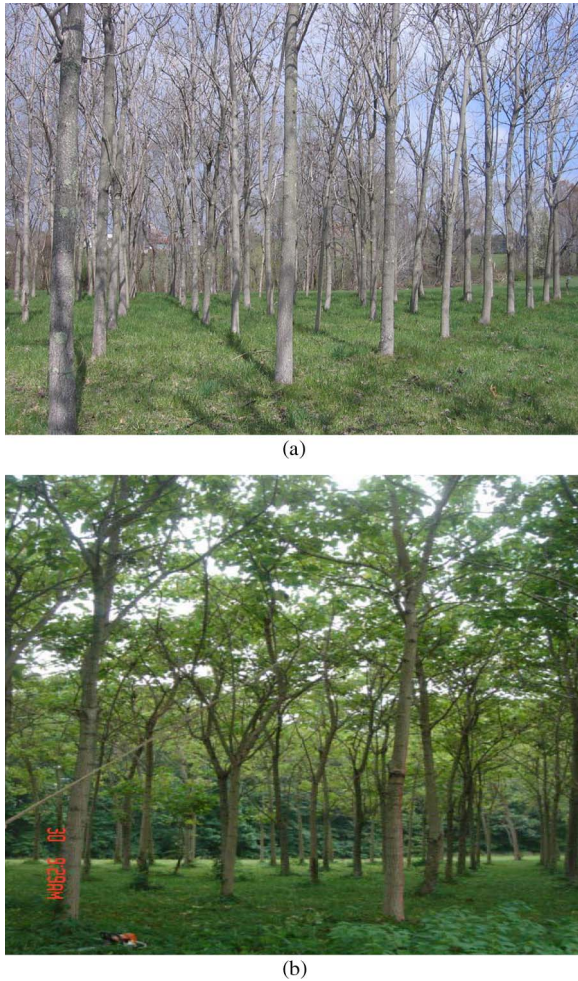


Fig. 5. Paulownia trees during (a) no-leaf and (b) full-canopy conditions.

arrangement at  $15^\circ$  increments within a  $60^\circ$  azimuth span. The resulting radiometer data for the tree plot at each incidence angle are an average of data from the three azimuthal observation locations.

Approximately coincident with the microwave measurements, theta probes which were inserted vertically into the first 6-cm depth of the soil and handheld infrared thermometers provided VSM and surface soil temperature, respectively. Ground measurements were taken at four arbitrary locations within each field of view and averaged for each incidence angle. Although the soil texture at the site was a loamy sand, consisting of 80% sand and 7% clay, the poor drainage features of the site resulted in generally wet soil conditions ( $VSM > 0.30 \text{ cm}^3 \cdot \text{cm}^{-3}$ ). The ground is flat with a relatively smooth surface, which consists of relatively short grass and weeds that were cut a few times during the year. The surface rms height was on the order of 0.5–1 cm, which was rather low compared to the wavelength at L-band.

The relative dielectric constants of the tree constituents were measured at L-band (1.25 GHz) *in situ* using dielectric probes connected to a vector network analyzer. The technique is based on reflection from an open-ended coaxial probe. The measured average relative dielectric constants are  $35.2 + i5.3$  for leaves,  $12.0 + i2.9$  for branches, and  $15.6 + i3.8$  for trunks. To permit proper interpretation of the measured microwave signals, a

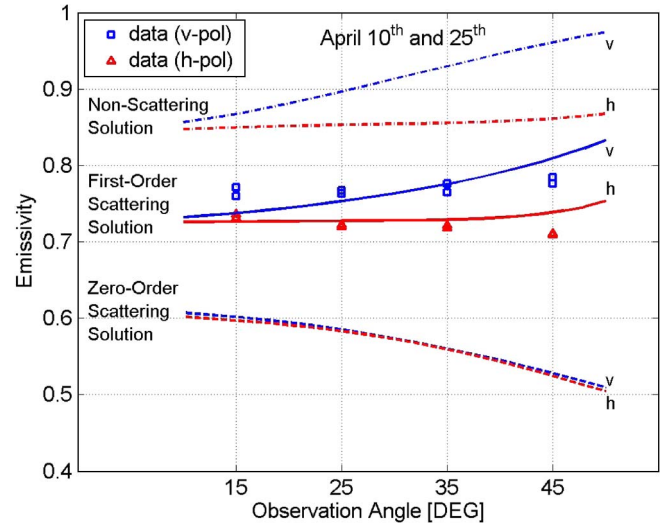


Fig. 6. Radiometric angular response from deciduous Paulownia trees is plotted. The dash-dot, solid, and dashed lines trace the simulated values of three models such as zero-order albedo, first-order scattering, and zero-order scattering solutions, respectively, while the squares and triangles represent v- and h-polarized measured data collected in April 2007, respectively.

representative tree outside the microwave footprint was cut down and destructively sampled. Detailed measurements of the size/angle distributions of the tree constituents (trunk, branches, and leaves), along with their densities, were made. The results from the canopy sampling and dielectric measurements are shown in Table I. The canopy sampling measurements were used in the model simulations described previously to produce emitted radiation at the ComRAD incidence angles so that simulation results can be compared with the measured data.

## V. RESULTS AND DISCUSSION

In this section, a set of canopy and surface parameters from the deciduous Paulownia stand is used to compute the response of the passive sensor. The goal is to use a physically based model such as the first-order RT approach to predict radiometric measurements and evaluate how the radiometer response to SM is modified by the forest canopy. The first-order scattering model will first be tested against the emissivity data (the ratio between the measured brightness and the ground ambient temperatures) from the deciduous Paulownia trees to verify the model validity by comparing with dual-polarization multiangular data collected in April. The model response to the seasonal and SM variations will then be evaluated. Once the model is validated, the effects of scattering are illustrated to indicate the model's major advantages. Illustrations are provided to show the contribution of each of the scattering processes described in Section III-B to the total received emission. The dependence of the scattering term on incidence angle and SM will also be explored at the end of this section.

The forest models described in Section III are used to calculate emissivity values at several incidence angles for the deciduous trees. To validate the first-order scattering model against the measured data and compare it with the nonscattering and zero-order scattering solutions, radiometric angular response from the deciduous trees is plotted in Fig. 6. In this figure, the nonscattering [the first term in (7)], the zero-order scattering

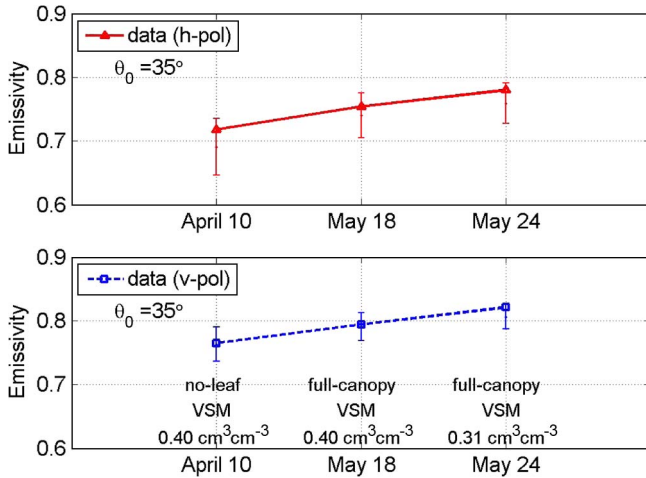


Fig. 7. Effect of season [April 10 (no leaf) versus May 18 (full canopy)] and SM [May 18 (VSM of  $0.40 \text{ cm}^3 \cdot \text{cm}^{-3}$ ) versus May 24 (VSM of  $0.31 \text{ cm}^3 \cdot \text{cm}^{-3}$ ) under full-canopy condition] at an observation angle of  $35^\circ$ . The upper plot shows h-polarization results, while the bottom plot shows v-polarization results. The error bars represent the simulated first-order model results for the range of surface *rms* heights of 0.5–1.0 cm.

(the  $\tau-\omega$  model), and the first-order scattering solutions are denoted by dash-dot, dotted, and solid curves, respectively. Soil with VSM of  $0.38 \text{ cm}^3 \cdot \text{cm}^{-3}$  and a surface *rms* height equal to 0.9 cm was considered in the simulations. The square and triangles represent the measured data which were collected in April 10 (with VSM of  $0.40 \text{ cm}^3 \cdot \text{cm}^{-3}$ ) and April 25 (with VSM of  $0.36 \text{ cm}^3 \cdot \text{cm}^{-3}$ ) under no-leaf conditions. The mean air temperatures during microwave measurements for April 10 and 25 were  $8^\circ\text{C}$  and  $19^\circ\text{C}$ , respectively. As we see from the plot, the first-order solution captures the angular and polarization behavior of the data well, the  $\tau-\omega$  model underestimates the tree emissivity for both polarizations, and the nonscattering solution overestimates the emissivity. The first-order solution balances the scattering albedo darkening effect with a single-scattering contribution for vegetation canopies (with large scatterers). The scattering in tree canopies takes place as a combination of reduction due to albedo and addition due to the single scattering.

In order to understand the impact of SM variations and foliation on the radiometric response, the measurements and the model generated curves for emissivity for three distinct days (April 10, May 18, and May 24) at an observation angle of  $35^\circ$  are plotted in Fig. 7. The solid line with triangular markers at the data points shows measured h-polarization, while the dashed line with square markers at the data points denotes measured v-polarization. The error bars represent the simulated first-order model results for the surface *rms* heights,  $\sigma$ , in the range of 0.5–1.0 cm, where the lower ends of the bars represent  $\sigma = 0.5 \text{ cm}$  while the upper ends of the bars denote  $\sigma = 1.0 \text{ cm}$ . In the figure, emissivities of full canopy (May 18) and no-leaf canopy (April 10) are compared, both of which had similar SM conditions (with VSM of  $0.40 \text{ cm}^3 \cdot \text{cm}^{-3}$ ). Both model results and measured data for these dates show that the radiometer is able to resolve the change in tree state under the condition that the SM does not vary. It is observed that the emissivity increases as trees get foliated. This is due to the fact that the contribution of the tree emission to the total emission increases

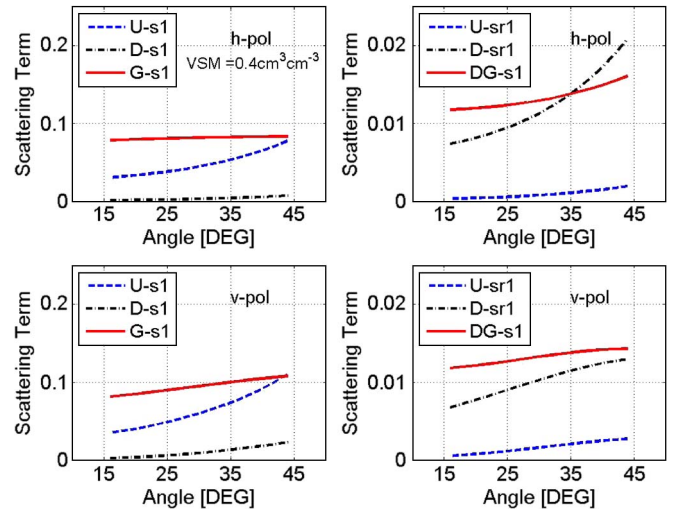


Fig. 8. Contributions of the individual scattering terms to the tree canopy scattering.

in the presence of leaves since the leaves have a significant effect on the canopy extinction and not much on scattering.

Fig. 7 also compares the effect of SM on the observed emissivity. The two days in proximity to each other (May 18 and May 24) were chosen to insure that the tree state did not change, but SM conditions were different. The mean air temperatures during microwave measurements for May 18 and 24 were  $13^\circ\text{C}$  and  $21^\circ\text{C}$ , respectively. As expected, the model predicts that emissivity increases with decreasing SM. This is due to the fact that emissivity of the ground increases with decreasing SM. A similar increase in measured emissivity is observed as the SM decreases from  $0.40 \text{ cm}^3 \cdot \text{cm}^{-3}$  (May 18) to  $0.31 \text{ cm}^3 \cdot \text{cm}^{-3}$  (May 24). For a fixed physical temperature of  $T = 300 \text{ K}$ , the change in brightness temperature for a  $0.09 \text{ cm}^3 \cdot \text{cm}^{-3}$  change in VSM is about 10 K. This clearly shows that the radiometer is able to sense SM variations under this type of tree canopy.

As a result of these model simulations and measurements given in Fig. 7, it can be concluded that both the soil surface and the tree canopy (SM and biomass) contribute together to the observed brightness temperature. Appropriate corrections for biomass must be made in order to make reliable SM estimation. In a similar manner, appropriate corrections for SM are needed to make reliable biomass estimation.

Fig. 8 shows significant terms contributing to the first-order scattering as a function of incidence angle. Note that the scale in plots on the right is given ten times finer than those on the left side for comparison purposes. The top figures represent h-polarization, while the bottom plots show results for v-polarization. The curve labels are defined in (9.b). As shown in the plots, the direct scattering terms for both polarizations due to upwelling (U-s1) and ground (G-s1) emissions are the most significant terms contributing to the first-order solution. The scattered upwelling (U-s1) emission is highly angular dependent, while the scattered ground (G-s1) emission is fairly constant over the range of angles plotted. Direct scattered downwelling (D-s1) emission is somewhat significant, and the reflected scattering (-sr1) terms are negligible compared to the direct scattered (-s1) terms.



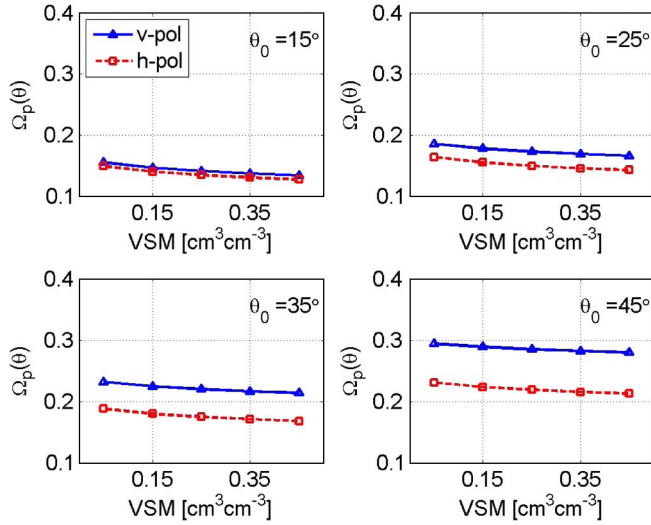


Fig. 9. Effect of SM on the total scattering term at the ComRAD observation angles (15°, 25°, 35°, and 45°).

In Fig. 9, the effect of SM on the total scattering term is shown. It shows the magnitude of the first-order scattering contribution over a range of VSM of 0.05–0.45  $\text{cm}^3 \cdot \text{cm}^{-3}$  at four different angles of observations. The plots indicate that the single scattered radiation increases the canopy brightness temperature considerably and it is mainly a function of the incidence angle and polarization of the microwave observation as also shown in Fig. 8. As the angle of observation increased from nadir, the scattering contribution increases and becomes more polarization dependent. This is because the v-polarized electric field becomes more aligned with the vertical tree components (vertical trunks and the tendency for the branches to be vertically oriented). The scattering term is complex since it is partly composed of single scattered energy that reflects from and is radiated by the soil surface. For typical values of SM as shown in the figure, the reflected scattering effect is negligible when compared to the direct scattering terms. This means that the scattering term is fairly constant over a wide range of SM conditions as confirmed by Fig. 9. This, in turn, can enable us to parameterize the scattering term with respect to specific vegetation types, anisotropic canopy structure, presence of leaves, and/or understory irrespective of the knowledge of moisture content of underlying soil.

## VI. SUMMARY AND CONCLUSION

Despite the progress that has been made in the development of global SM retrieval algorithms, accurately correcting for the effects of vegetation scattering and attenuation over a wide range of vegetation canopies remains one of the ongoing challenges. In this paper, the development of a physically based model was pursued by employing a first-order vegetation scattering solution to RT equations. An analytical solution method of the RT equations, based on the successive orders of scattering, was described and used to calculate emission from forested terrain. The zero- and first-order scattering solutions were computed and compared with truck-based measurements of brightness temperature at L-band over small deciduous tree

stands. It was found that the first-order scattering solution alone produces a good agreement with the experimental data. The first-order model was validated against multiangle deciduous data, and its response to seasonal and SM variations was also demonstrated. Contributions of the individual scattering terms to total tree scattering were discussed. Significant terms contributing to forest scattering were identified, and their dependence on incidence angle and SM was shown.

As the simulation results indicate, the  $\tau$ - $\omega$  model *will* need modification (in terms of form or effective parameterization) to enable accurate characterization of vegetation parameters when applied over moderately to densely vegetated landscapes. More scattering terms (at least up to first order at L-band) should be included in the RT solutions for forest canopies due to the large size of the tree canopy components with respect to wavelength. We propose a new SM retrieval model called the  $\tau$ - $\omega$ - $\Omega$  model (the first-order RT model), given by

$$e_p^{(1)}(\theta) = [1 - \gamma_p^2(\theta)R_{sp}(\theta)] - \omega_p(\theta) [1 + \gamma_p(\theta)R_{sp}(\theta)] [1 - \gamma_p(\theta)] + \Omega_p(\theta). \quad (14)$$

This model can be attractive for routine microwave SM retrieval since the formula relating terrain emission is physically based, takes canopy scattering into account properly, and requires few parameters. The new parameter  $\Omega_p(\theta)$  depends on polarization and incidence angle and is mostly SM independent. This model could potentially overcome the vegetation scattering limitation and thus could be used with SMAP and SMOS data to increase the accuracy and reliability of SM products over moderately to densely vegetated landscapes. The implementation for this new SM inversion model is out of the scope of this paper and is left as future work.

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